

# Unified Modeling, Simulation, and Market Implications: FASTSim and ADOPT



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**National Renewable Energy Laboratory**  
**6/18/2014**

Project ID # VAN004

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# Overview

## Timeline

**Project Start Date:** Oct. 2013

**Project End Date:** Sept. 2014

**Percent Complete:** 60%

## Budget

**Total Project Funding:** \$450

**Funding Received in FY13:** \$150K

**Funding for FY14:** \$150K

## Barriers

- **Barriers addressed:** Many
  - Assess the impact that DOE vehicle technology targets have on DOE end goals

## Partners

- Interactions/collaborations
  - GM<sup>1</sup>/Ford/Chrysler/EIA<sup>2</sup>/ORNL<sup>3</sup>
  - ANL<sup>4</sup>/SRA International
- Project lead: NREL

1. GM: General Motors
2. EIA: U.S. Energy Information Administration
3. ORNL: Oak Ridge National Laboratory
4. ANL: Argonne National Laboratory

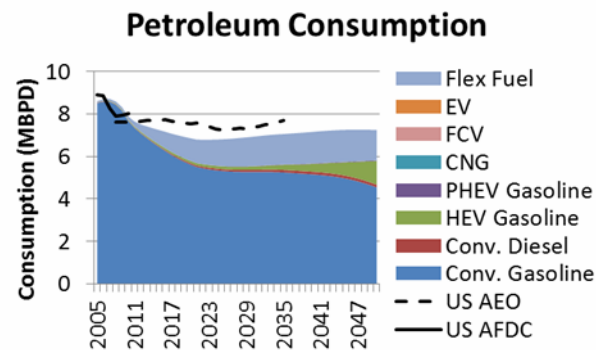
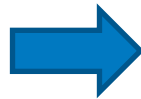
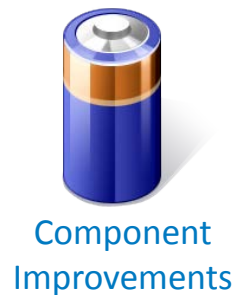
# Relevance

VTO Goals ([http://www1.eere.energy.gov/vehiclesandfuels/about/fcvt\\_mission.html](http://www1.eere.energy.gov/vehiclesandfuels/about/fcvt_mission.html)):

- Reduce dependence on foreign oil and GHG emissions

## Relevance

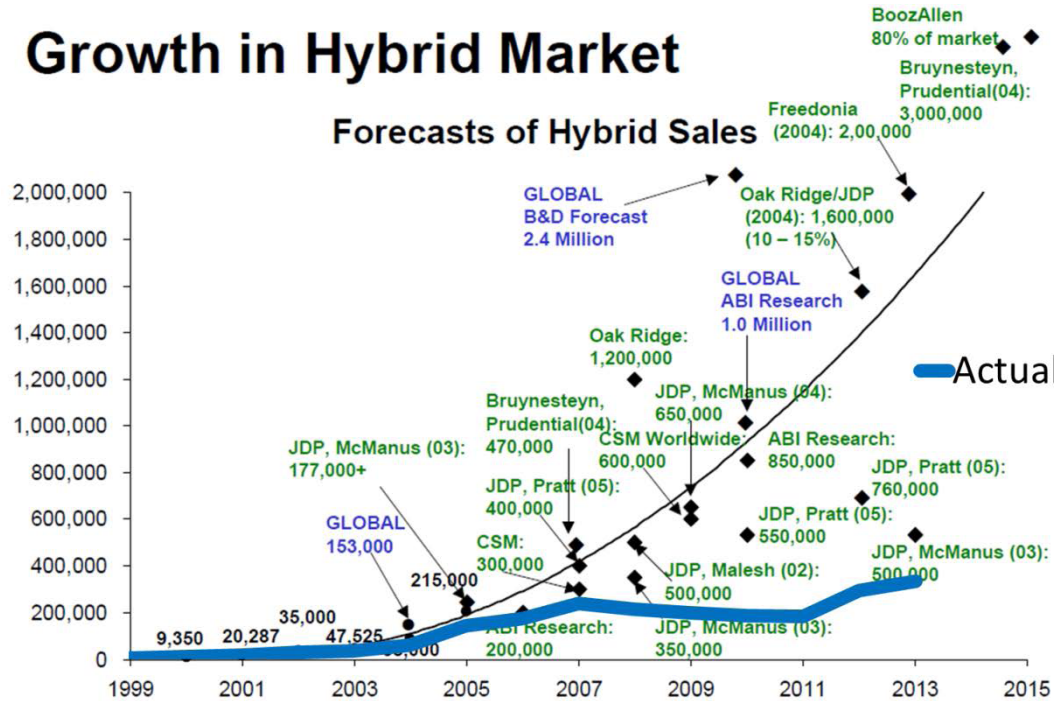
- This project improves the estimation of the impact of vehicle technology improvements on overall VTO goals



VTO = Vehicle Technologies Office  
GHG = greenhouse gas

# Relevance: Improve Accuracy (Confidence)

## Growth in Hybrid Market



Large error

- Project Objectives

hybridCARS.com

- Improve confidence and functionality
- Estimate technology impacts on plug-in electric vehicle sales
- Publish on FASTSim/ADOPT's approach, validation, and results

ADOPT = Automotive Deployment Options Projection Tool  
FASTSim = Future Automotive Systems Technology Simulator

# Milestones

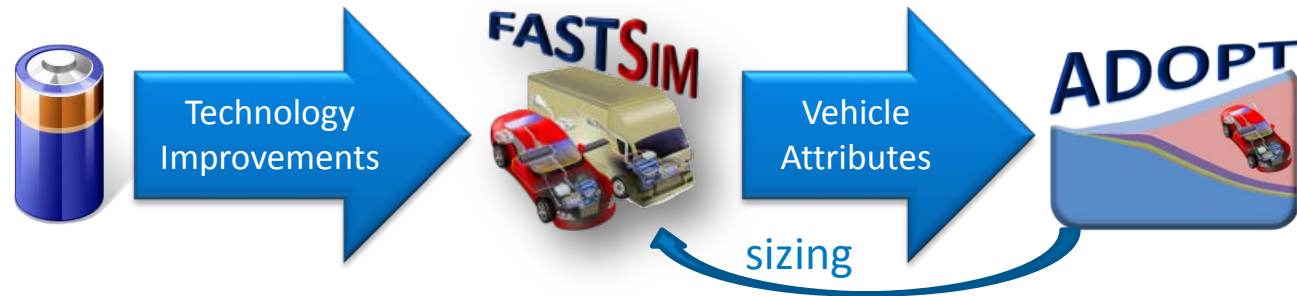
Month/ Year	Milestone or Go/No-Go Decision	Description	Status
Dec. 2013	Quarterly update	Added technology improvements over time, consumer heterogeneity, comparison with other models	Complete
March 2014	Quarterly update	Improved interface, run times, CAFE compliance, validation, and approach to adding model options	Complete
June 2014	Analysis progress update	Estimate technology impacts on plug-in electric vehicle sales.	On schedule
Sept. 2014	Milestone & Paper	Publish paper describing tool, approach, validation, and results.	On schedule

CAFE = corporate average fuel economy

# Approach: FASTSim/ADOPT Overview

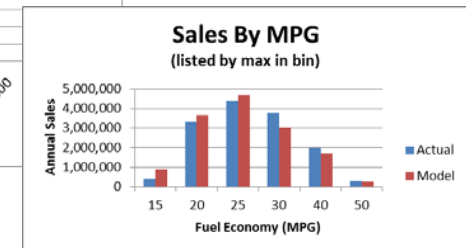
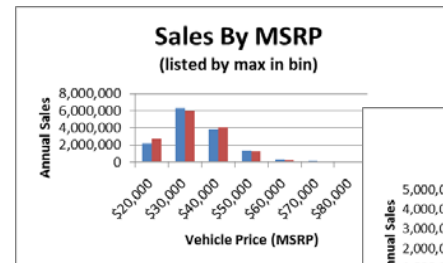
- Estimate advanced technology impact on U.S. light-duty (LD) vehicles

- Petroleum use
- GHG emissions



- ADOPT's choice model

- Uses a logit function
- Competes all LD vehicles
  - Over 1,000 makes, models and trims
- Validates well with historical sales



- ADOPT's stock model captures key aspects

- Change in vehicle travel distance with vehicle age
- New model creation
- Scrap rates with vehicle age

# Approach: Estimated Petroleum Use



Price, acceleration, efficiency, range, size

Consumer Choice



Fuel prices

Photo by Keith Wipke, NREL 15986

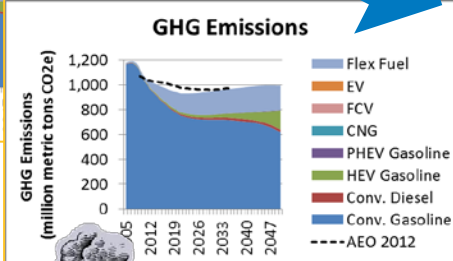
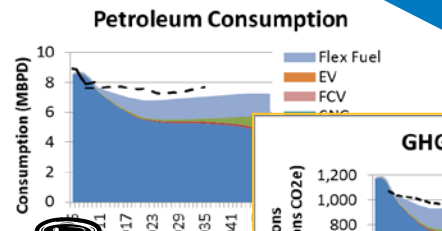
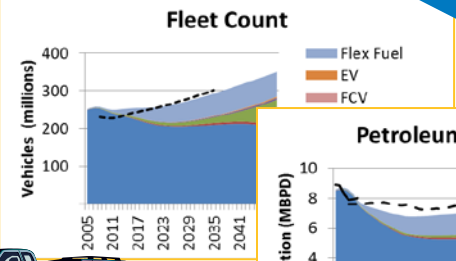
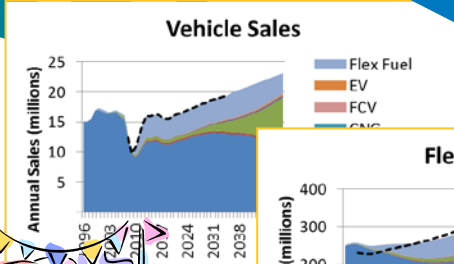


Income distribution



Fueling station availability

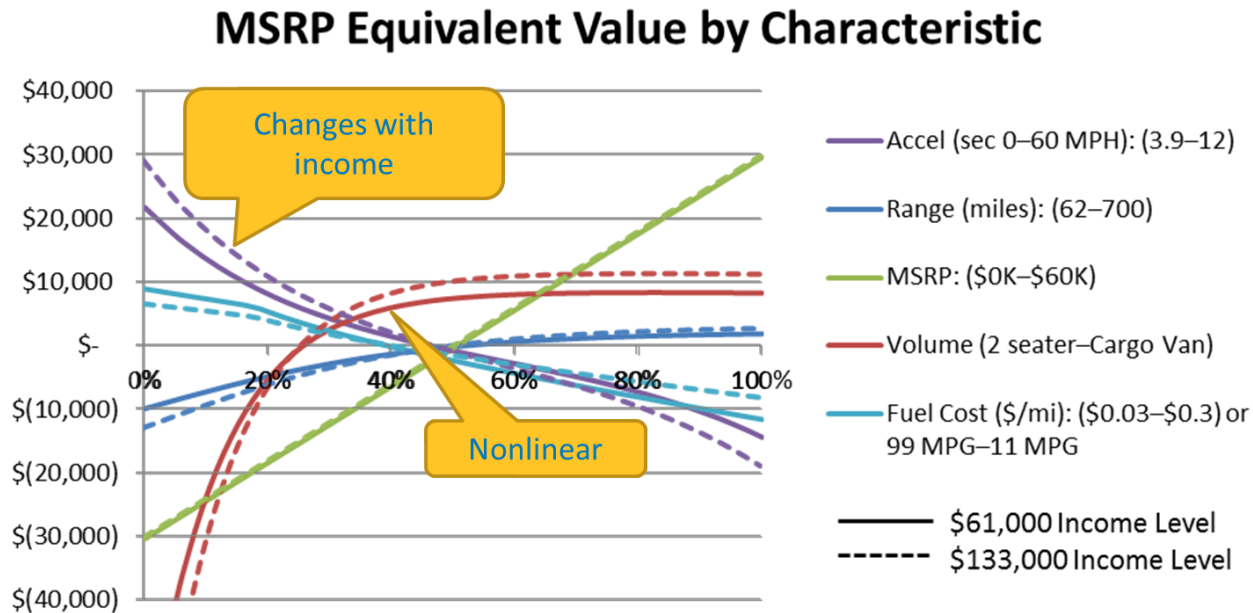
Photo by Michael Peney, NREL 19206



# Approach: ADOPT's Consumer Choice Function

- **Logit function uses weighting factors to capture relative importance of each attribute**
  - $S_V$ : Market share for vehicle model V
  - $E_A$ : Coefficient for attribute A
  - $V_A$ : Value of attribute A for vehicle V
  - x: Sales distribution factor

$$S_V = \frac{EXP(\sum_A (E_A \times V_A))^x}{\sum_V (EXP(\sum_A (E_A \times V_A))^x)}$$

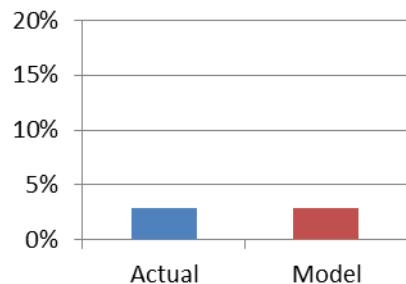




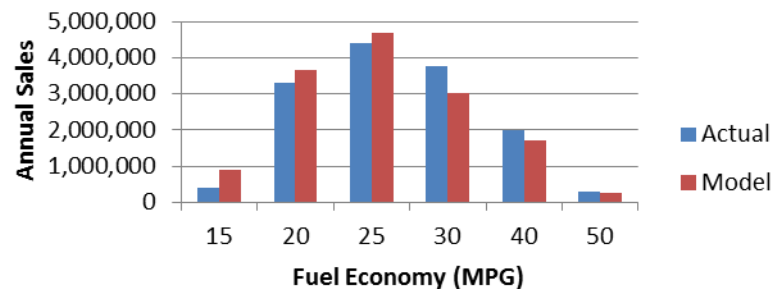
# Approach: Validation

## Example: 2012 U.S. Sales

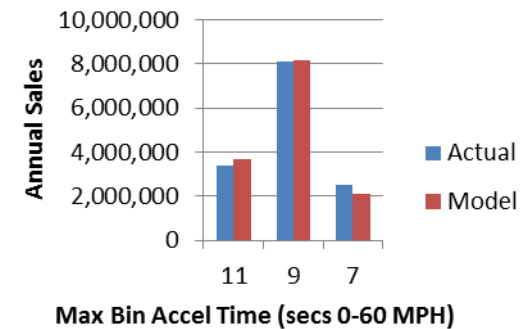
### Percent HEV Sales



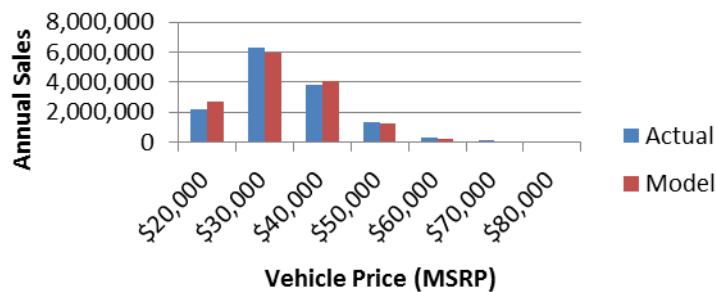
### Sales By MPG (listed by max in bin)



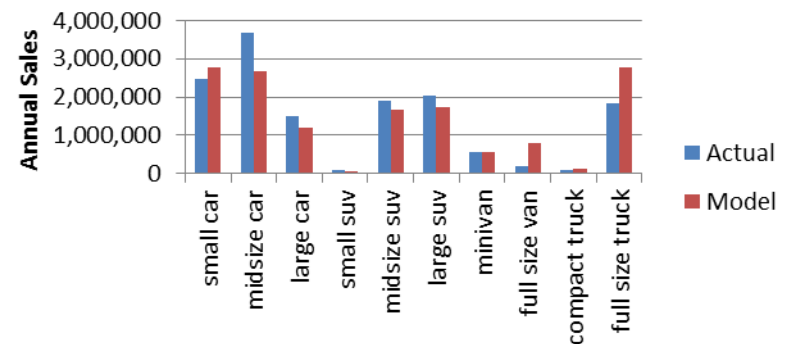
### Sales By Acceleration



### Sales By MSRP (listed by max in bin)



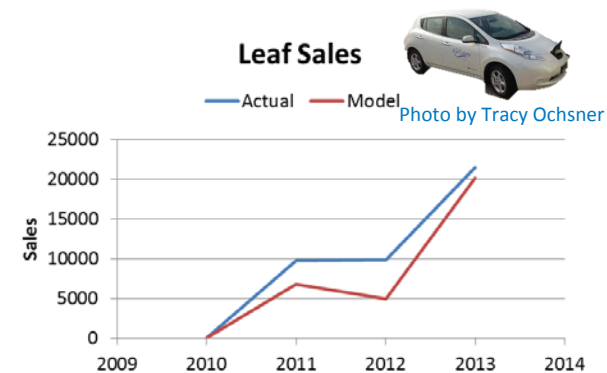
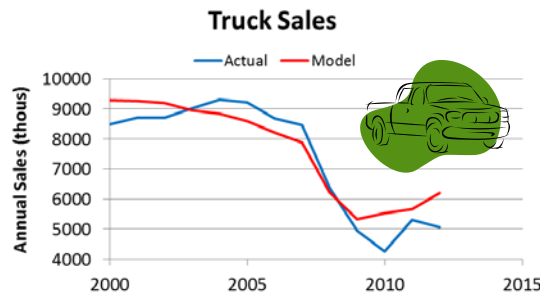
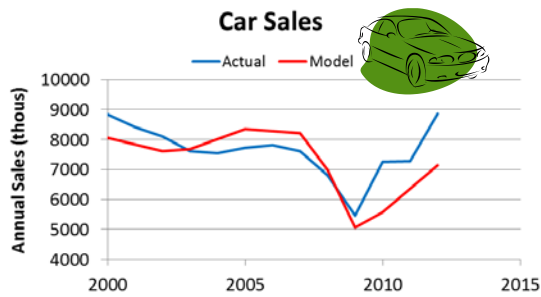
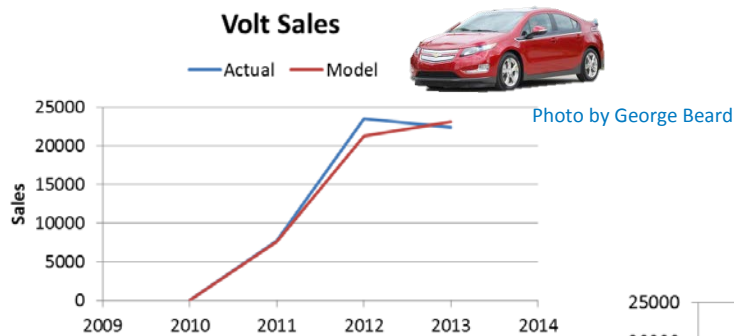
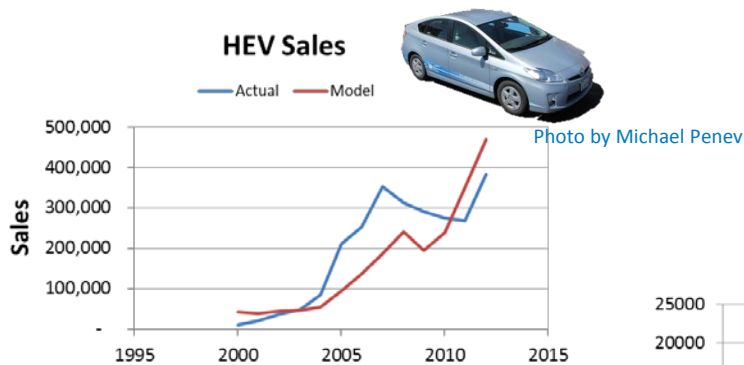
### Sales By Class



HEV = hybrid electric vehicle; MPG = miles per gallon  
 MPG = miles per gallon  
 MSRP = manufacturer's suggested retail price

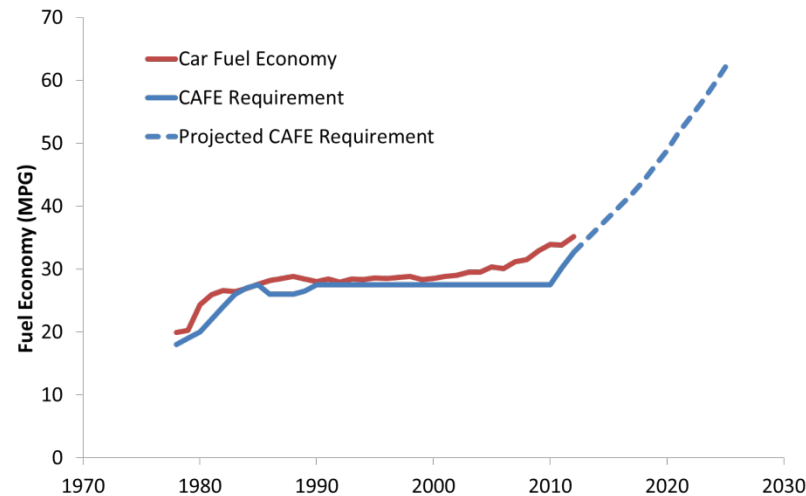
# Accomplishments: Improved Confidence

- Expanded vehicle attributes to change by year
  - Example: Volt MSRP drops from \$40k to \$35k (2011 – 2013)
  - More accurate validation



# Accomplishments: Improved Confidence

- **Added techniques to meet CAFE**
  - CAFE drives fuel economy



- CAFE is based on vehicle footprint – added data to all vehicles
- Added CAFE drivers
  - Engine downsizing: Reduces fuel economy, cost, and acceleration
  - Incentives/penalties
  - Future: Add many more options using FASTSim and other models

# Accomplishments: Improved Confidence

- **Increased consumer heterogeneity (mixing) to improve substitution patterns**

- Use a distribution of consumer tastes ( $E_A$  values) for:

- Fuel cost
- Acceleration
- Size

- Improved historical HEV sales validation

- Compared model to actual sales for 47 different HEVs

$$S_V = \frac{EXP(\sum_A(E_A \times V_A))^x}{\sum_V(EXP(\sum_A(E_A \times V_A))^x)}$$

$S_V$ : Market share for vehicle model V

$E_A$ : Coefficient for attribute A

$V_A$ : Value of attribute A for vehicle V

x: Sales distribution factor

# Accomplishments: Improve Functionality

- **Added technology improvements over time**

- Battery price
- Motor price
- Gasoline engine efficiency
- Diesel engine efficiency
- Atkinson engine efficiency
- Lightweighting
- Benefit: Used to estimate benefits of achieving DOE progress toward technical targets



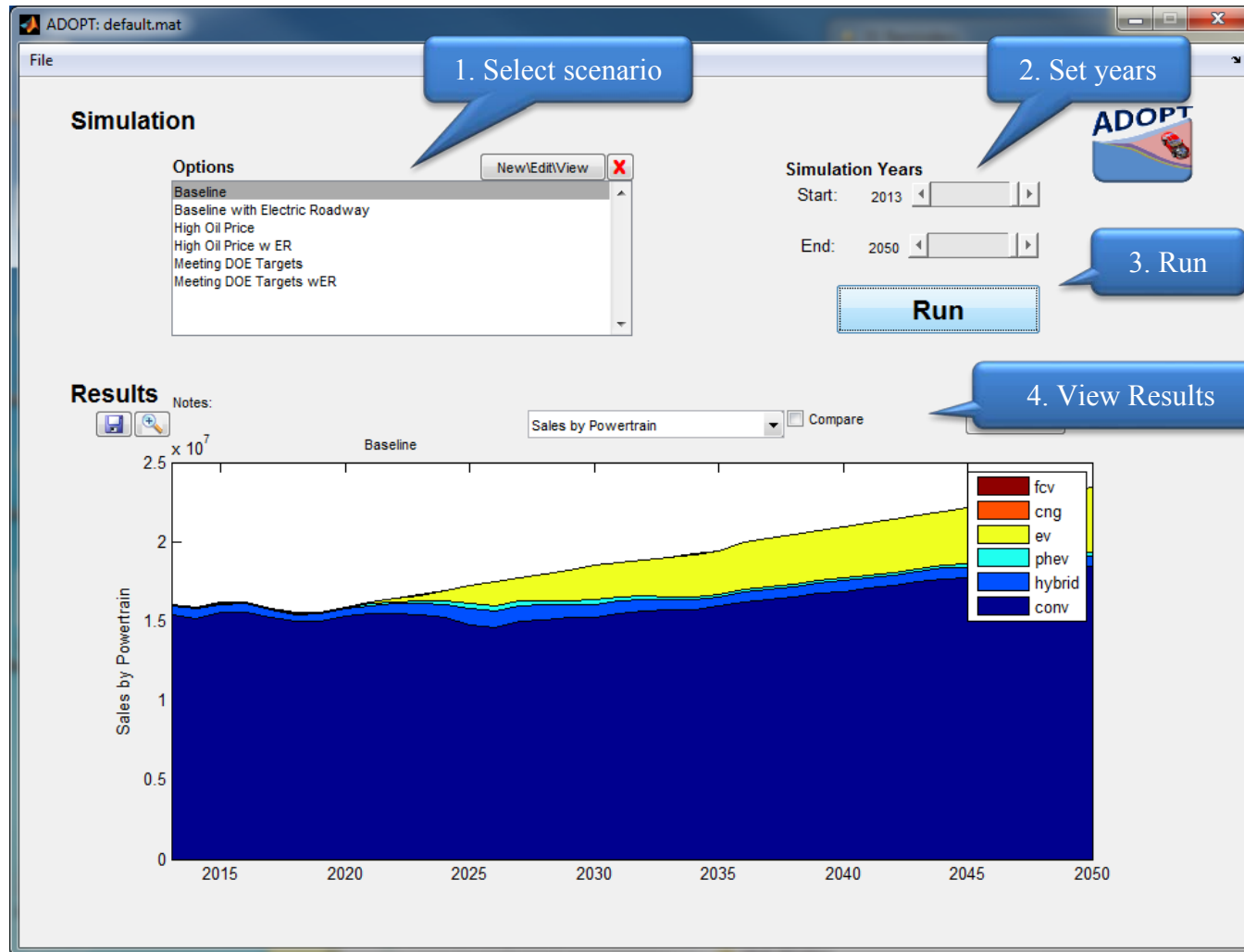
- **Increased speed**

- Run time increased to 30 minutes after adding mixing
- Decreased to less than 30 seconds
  - Moved to MATLAB
  - Used vectorization (minimized “for loops”)
  - Pre-allocated space for all growing variables
- Benefit: Allows for more model testing and analysis



# Accomplishments: Improve Functionality

## Simplified user interface



# Accomplishments: Improve Functionality

## Simplified user interface: Scenario Editor

Scenario Editor

Scenario/Region Category Combination

Baseline   Show detailed options

Constants: [baseline](#)  
Max Penetration Rate: [baseline](#)  
New Model Trigger: [baseline](#)  
Scrap Model Trigger: [baseline](#)  
Average Engine Power Percent Of 2012: [baseline](#)  
Incentives: [US](#)  
GHG Rates: [US EIA](#)  
Mixing: [None](#)  
Vehicle Data: [Default](#)  
Vehicle Miles Traveled: [US](#)  
Survival: [US](#)  
Technology Improvements: [Approx DOE Goals](#)  
**Fuel Prices: [AEO 2013\\_Ref](#)**  
Hydrogen Refueling Availability: [Almost none](#)  
CNG Refueling Availability: [US 2012](#)  
Household Income: [US](#)  
Number Of Households: [US](#)  
Sales: [US](#)  
Ethanol: [BaselineEstimate](#)  
CAFE Coefs: [AsOfJan2014](#)

Category Choice

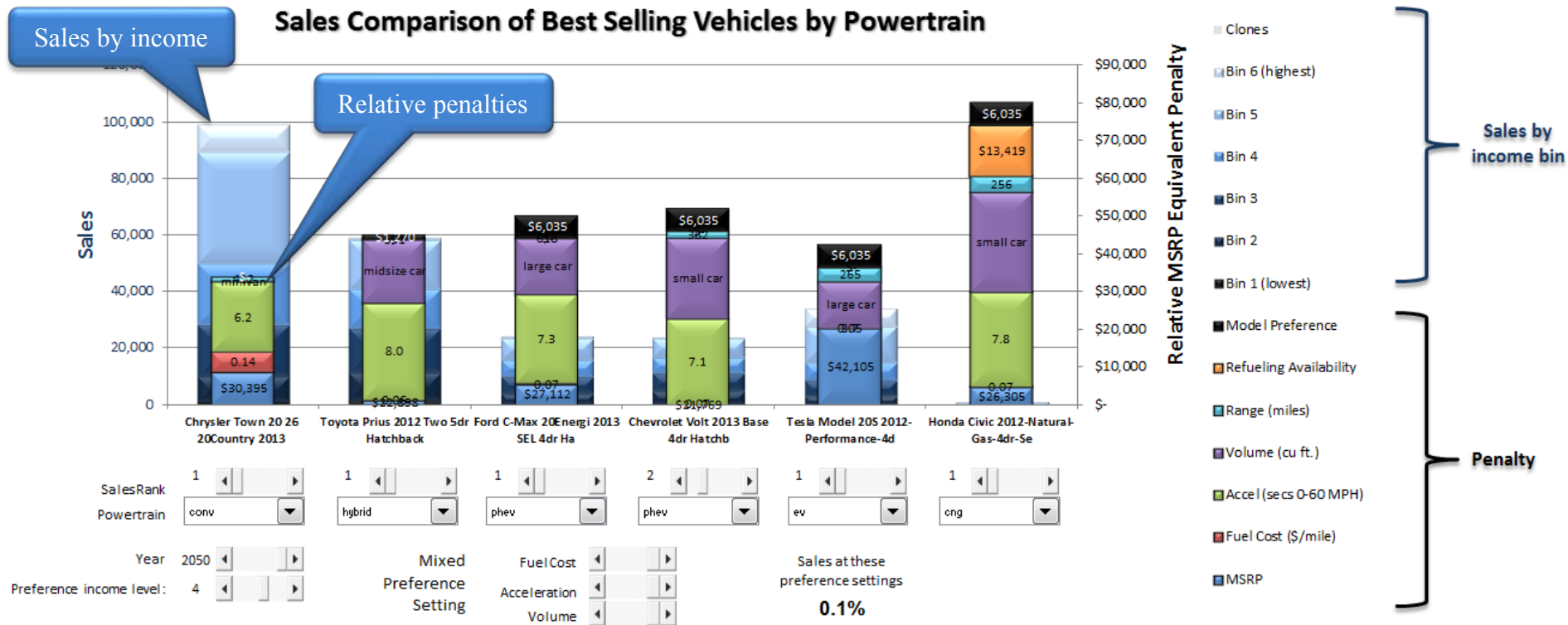
AEO\_2013\_Ref

gasolineDolPerGal  
dieselDolPerGal  
electDolPerKwh  
cngDolPerGge  
e85DolPerGal  
hydrogenDolPerKg

years	1	2	3	4	5	6	7	8
1970	1971	1972	1973	1974	1975	1976	1977	
gasolineDolPerGal	2.4300	2.4300	2.4300	2.4300	2.4300	2.4300	2.3800	
dieselDolPerGal	2.5200	2.5200	2.5200	2.5200	2.5200	2.5200	2.5200	2.5200
electDolPerKwh	0.1300	0.1300	0.1300	0.1300	0.1500	0.1500	0.1500	0.1600
cngDolPerGge	0.8300	0.8400	0.8500	0.8600	0.8600	0.9400	1.0300	1.1400
e85DolPerGal	1.2500	1.2500	1.2500	1.2500	1.2500	1.2500	1.2500	1.2500
hydrogenDolPerKg	10.1200	10.1200	10.1200	10.1200	10.1200	10.1200	10.1200	10.1200

# Accomplishments: Improve Functionality

- Added plot that shows why the sales occur





# Responses to Previous Year Reviewers' Comments

- **Comment: “...it seemed superfluous to add all of the current models to a simulation that extends to 2050, since all of the current types will be replaced in the future.”**
  - Improves validation (model-by-model historical comparisons)
  - Helps capture more variations like the Prius
  - Helps calibrate preferences (different combinations of attributes)
  - Other reviewer: “...expanding the number of represented vehicles and having the capability to evolve vehicles is beneficial to adding realism.”
- **Comment: “...the effect of CAFE will be important.”**
  - We have started adding approaches to meet CAFE
  - We are proposing additional work in this area

# Collaboration and Coordination

- **Received input and feedback from:**
  - Industry
    - Chrysler
    - Ford
    - GM
  - Government
    - U.S. Department of Transportation
    - ANL
    - EIA
    - ORNL
  - Universities
    - UC Davis
- **Data provided by:**
  - PA Consulting Group
  - Polk
  - SRA International (Sentech)

# Remaining Challenges

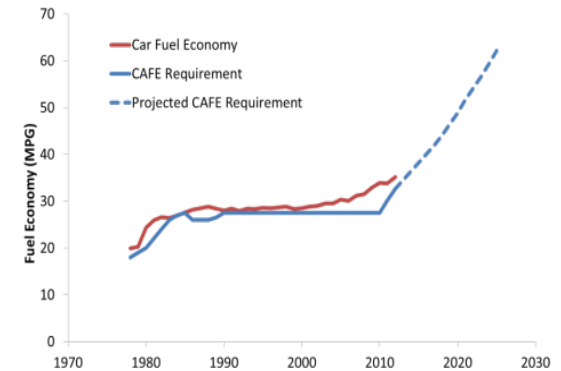
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- **Account for battery electric vehicle range and recharge time interaction (FY14)**
- **Improve approach to meeting CAFE**
- **Further improve model accuracy (confidence)**
- **Expand on capturing technology improvements**

# Proposed Future Work

- **VTO Vision: Robust analysis**

- Expand on approach to meeting CAFE
  - Current: Engine downsizing, incentive/penalty, advanced powertrains, DOE targets
  - Additions from EPA document\* including:
    - Final drive ratio (acceleration vs. efficiency)
    - Start/stop
    - Improved accessories
  - Evaluate impact of CAFE (trucks vs. cars)
- Add regions to capture
  - State tax credits
  - Regional fuel/electricity prices
- Add learning curve option for technology improvements

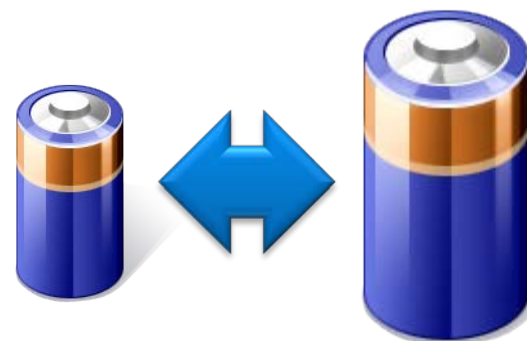


\* United States Environmental Protection Agency, "Regulatory Impact Analysis Final Rulemaking for 2017-2025 Light-Duty Vehicle Greenhouse Gas Emission Standards and Corporate Average Fuel Economy Standards", report EPA-420-R-12-016, August 2012.

# Proposed Future Work

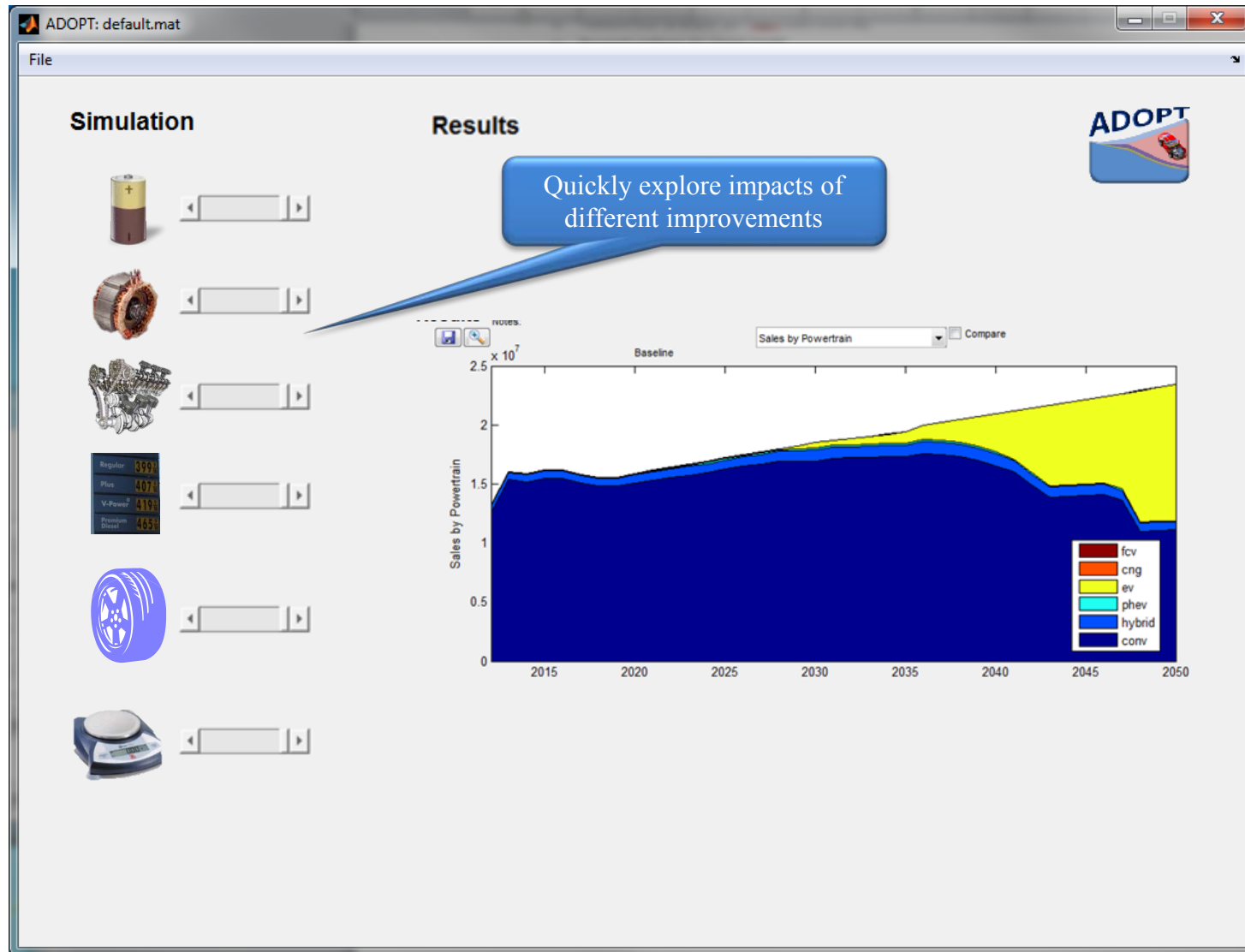
- **VTO Vision: Robust analysis**

- Expand and improve vehicle evolution
  - Evolve battery size
  - Expand across class sizes
  - Seed one model with a technology and let ADOPT expand options
  - Speed up evolution algorithm
- Evaluate and add the neighbor effect to determine the impact on petroleum use and GHGs
  - Review the literature
  - Use sales by zip code and ADOPT to explore further
  - Implement and validate
- Stretch mixing distribution and look for tipping points



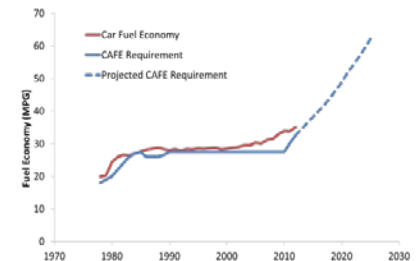
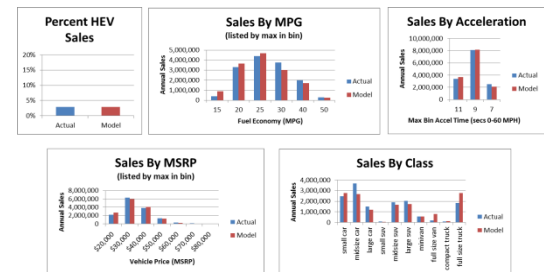
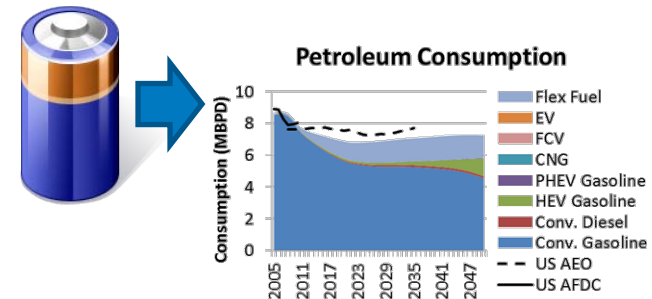
# Proposed Future Work

VTO Mission: Plan, execute, and communicate (slider & knob interface)



# Summary

- Estimating the impact of technology R&D on petroleum and GHG goals is key to
  - Estimate current pathway effectiveness
  - Understanding how to adjust R&D targets to meet goals
- The FASTSim/ADOPT tool provides an extensively validated approach
- It still needs an improved approach to CAFE
- Other potential improvements should be explored (neighbor effect)



# Technical Back-Up Slides

(Note: please include this “separator” slide if you are including back-up technical slides (maximum of five). These back-up technical slides will be available for your presentation and will be included in the DVD and Web PDF files released to the public.)

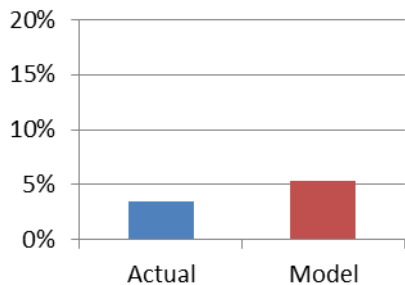


# Choice Model: Validation

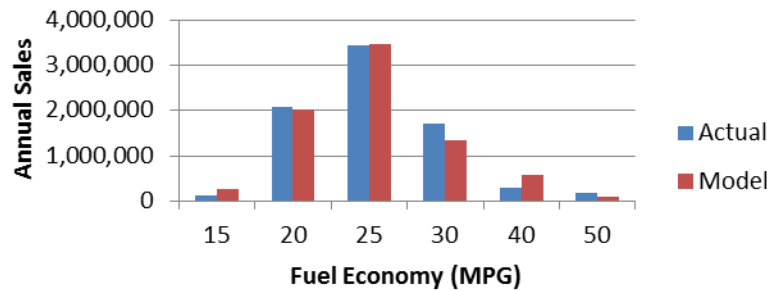


## 2008 U.S. Sales

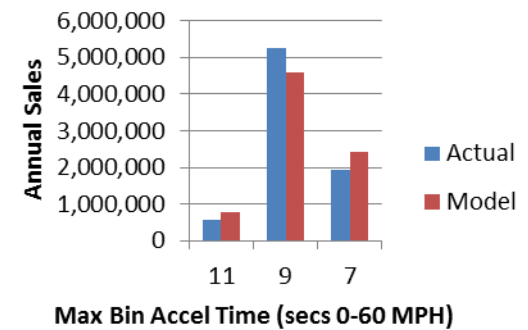
### Percent HEV Sales



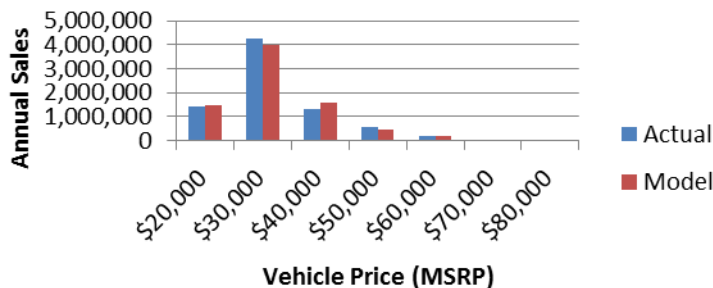
### Sales By MPG (listed by max in bin)



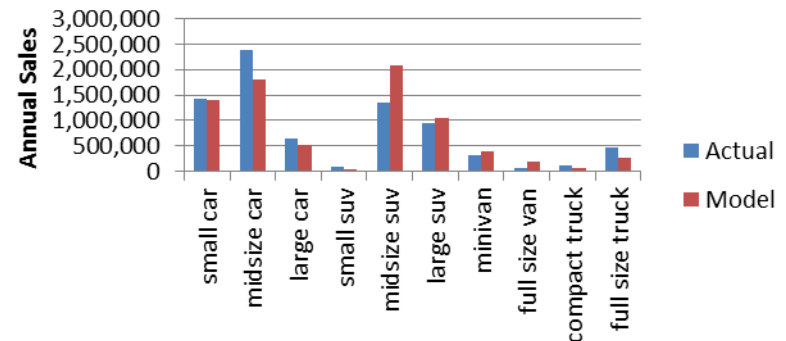
### Sales By Acceleration



### Sales By MSRP (listed by max in bin)



### Sales By Class

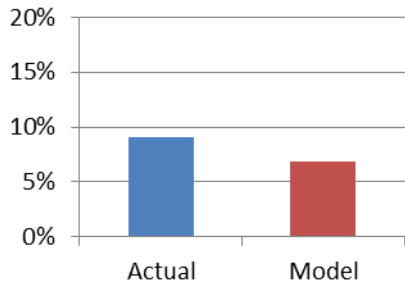


# Choice Model: Validation

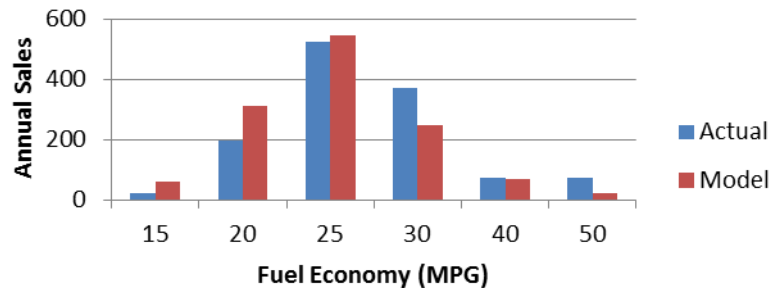


## 2008: 90004 (Los Angeles, CA)

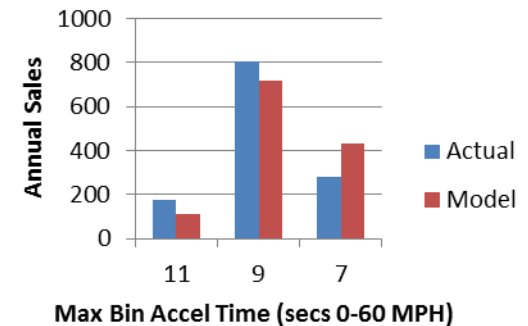
### Percent HEV Sales



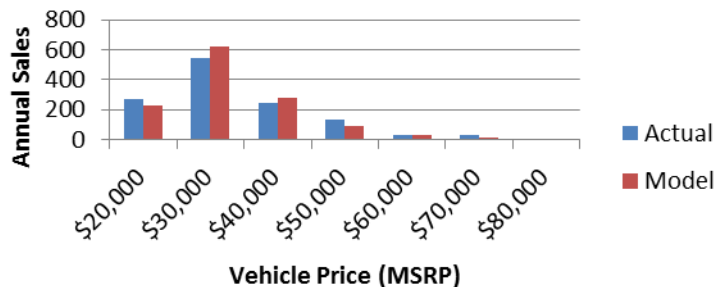
### Sales By MPG (listed by max in bin)



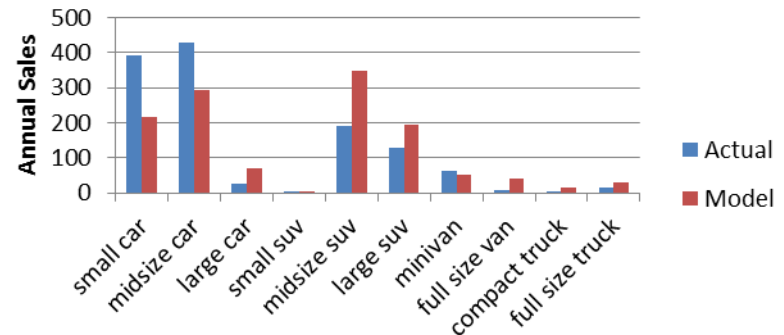
### Sales By Acceleration



### Sales By MSRP (listed by max in bin)



### Sales By Class



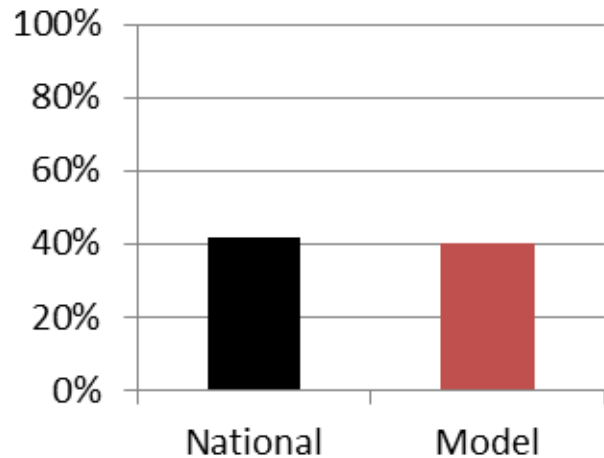
# Choice Model: Validation



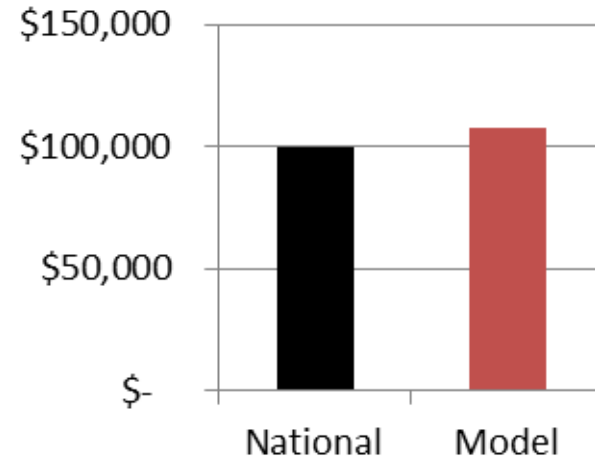
## 2012 U.S. Sales

Model matches *who* is purchasing hybrids

**HEV Buyers with  
Income Over \$100k**



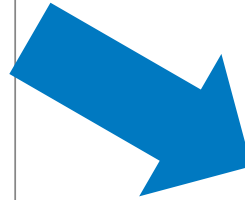
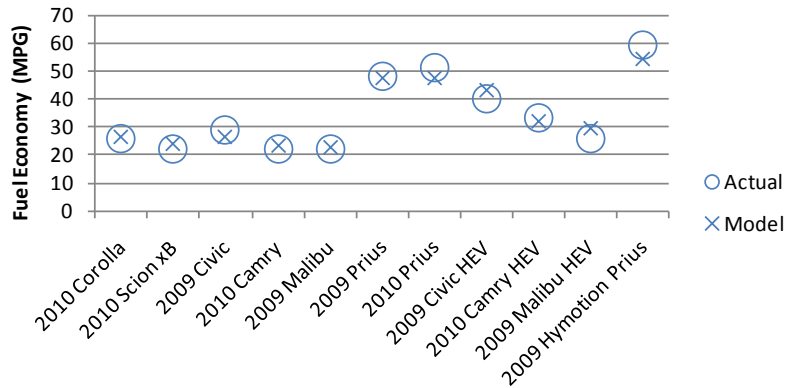
**Average Income of  
HEV Buyers**



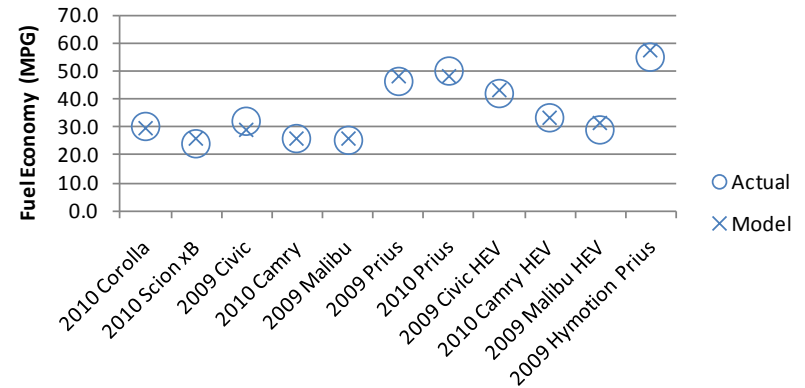
# FASTSim Fuel Economy Validation



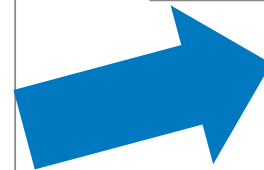
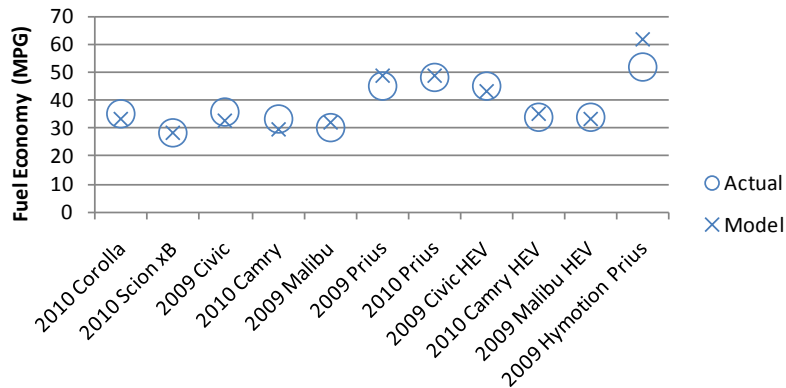
## UDDS Validation



## Fuel Economy Validation



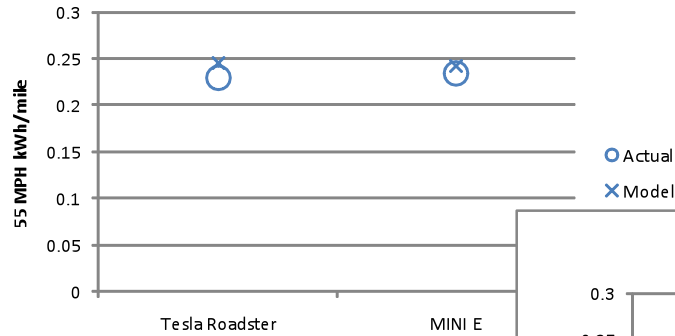
## Highway Validation



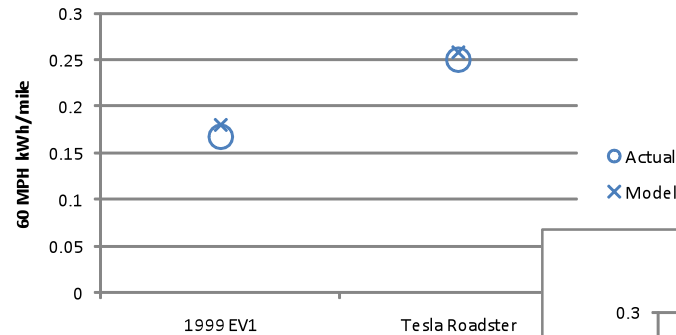
# FASTSim EV Efficiency Validation



### Const 55 MPH Validation



### Const 60 MPH Validation



### Const 65 MPH Validation

